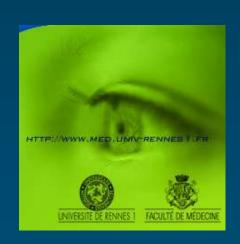
#### Ontological Spring Naumburg, Germany - April 17-20, 2002

# From UMLS concept spaces to a biomedical ontology

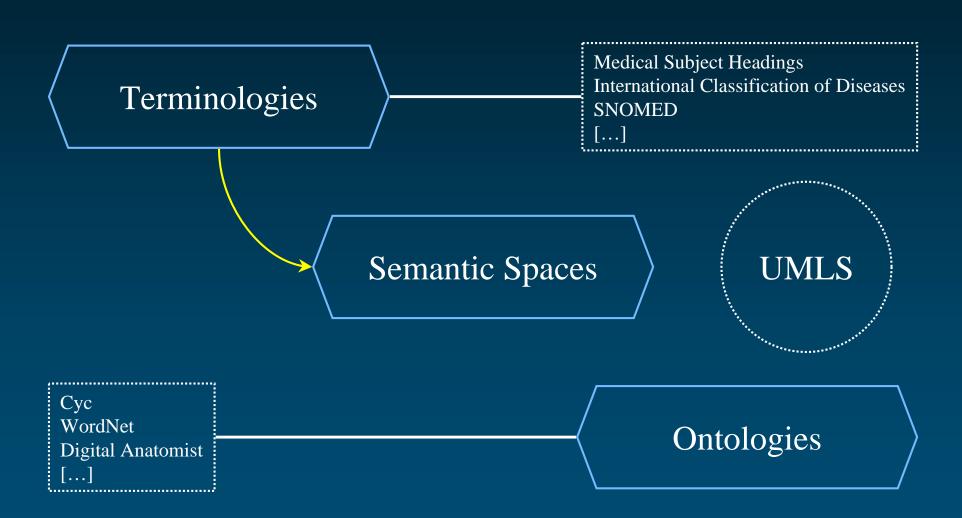


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# Biomedical knowledge organization



## Biomedical terminologies

- ◆ Core vocabularies
  - anatomy (UWDA, Neuronames)
  - drugs (First DataBank, Micromedex)
  - medical devices (UMD, SPN)
- Several perspectives
  - clinical terms (SNOMED, CTV3)
  - information sciences (MeSH, CRISP)
  - administrative terminologies (ICD-9-CM, CPT-4)
  - standards (HL7, LOINC)

# Biomedical terminologies (cont'd)

- Specialized vocabularies
  - nursing (NIC, NOC, NANDA, Omaha, PCDS)
  - dentistry (CDT)
  - oncology (PDQ)
  - psychiatry (DSM, APA)
  - adverse reactions (COSTART, WHO ART)
  - primary care (ICPC)
- ◆ Knowledge bases (AI/Rheum, DXplain, QMR)

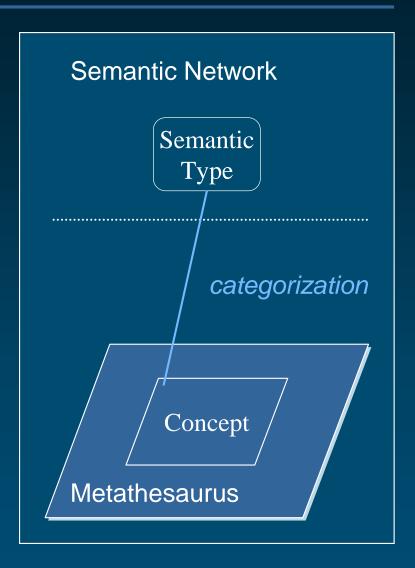
#### Outline

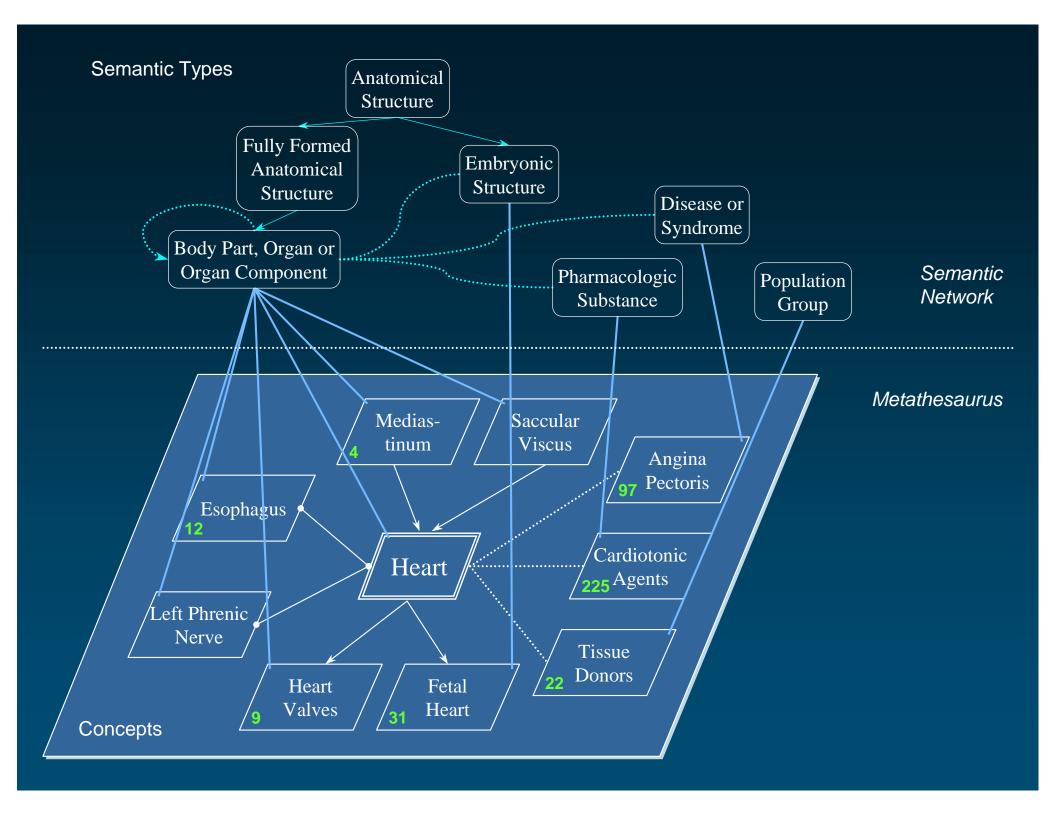
- ◆ UMLS concept spaces
- From concept spaces to ontologies
  - Structural approach
  - Semantic approach
  - Linguistic approach

# UMLS concept spaces

#### **UMLS**

- ◆ Two-level structure
  - Semantic Network
    - 134 Semantic Types (STs)
    - Relationships among STs
  - Metathesaurus
    - 800,000 concepts
    - Inter-concept relationships
  - Link = categorization
    - Often isa
    - Rarely is an instance of





#### UMLS Semantic locality

What characterizes concepts

[McCray & al., Methods 1995]

- Textual definitions
- Set of terms having the same meaning
- Set of related concepts
  - Hierarchical relationships
  - Associative relationships
    - Symbolic
    - Statistical
- Categorization (semantic types)

# Semantic locality

[Nelson & al., AMIA 1992]

#### Concept space

## UMLS Concept spaces

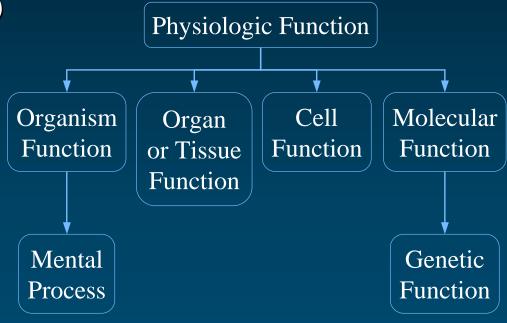
- Set of related concepts
- ◆ Useful for
  - Navigation UMLS Semantic Navigator
     umlsks.nlm.nih.gov → Resources → Semantic Navigator
  - Automatic indexing/ Information retrieval

[Bodenreider & al., AMIA 1998]

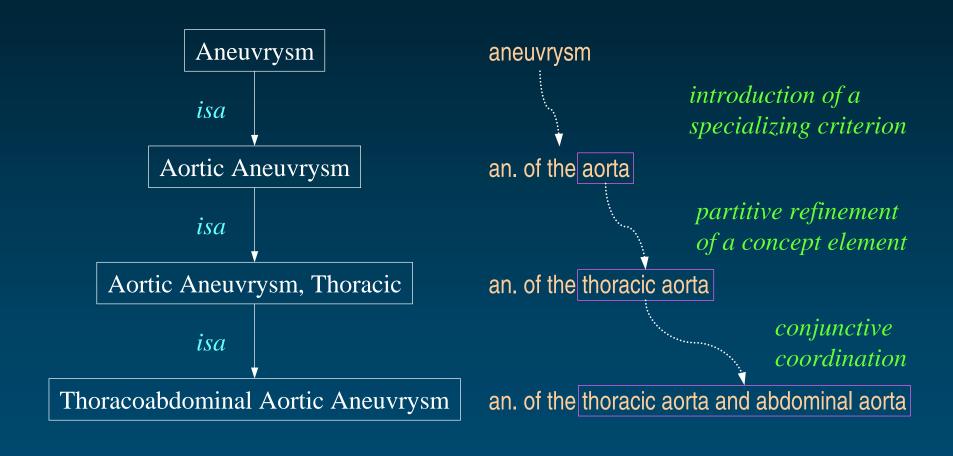
- But no ontology because
  - No[t enough] definitions
  - No consistent principles used to organized concepts

## Hierarchy

- Hierarchical relationships
  - Taxonomy (isa)
  - Meronomy (part of)
- Partial ordering
  - [Reflexivity]
  - Antisymmetry
  - Transitivity
- **♦** Inheritance
- Reasoning



## Principles of subsumption



#### Hierarchies in source vocabularies

- **♦** Structure
  - Single tree
  - Polyhierarchical (multiple parents)
- Relationships
  - Usually implicit
  - May be other than *isa* or *part of* 
    - E.g., Thesaurus relationships

#### Hierarchies in source vocabularies

- Often task-driven rather than based on principles
- Usually suitable for information retrieval
  - Better recall
  - Precision may not be crucial
- Generally not suitable for reasoning

## **UMLS** Biomedical ontology

- Assumption
  - The UMLS has the potential to provide [most of] the concepts and relationships needed in a biomedical ontology
- Ontology requirements
  - Relationships must be explicit
  - Relationships must be principled
  - Relationships must be consistent
- ◆ Problem
  - Select UMLS relationships compatible with ontology requirements

# From concept spaces to ontologies

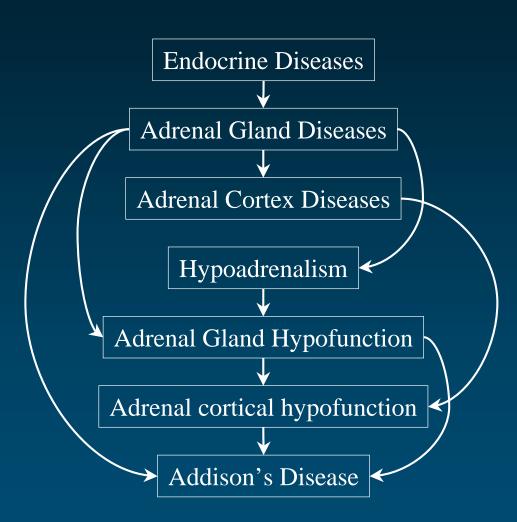
## Several approaches

- Structural approach
  - Properties of partial ordering relations
- Semantic approach
  - Consistency between relationships in the Semantic Network and in the Metathesaurus
- Linguistic approach
  - Properties of adjectival modification

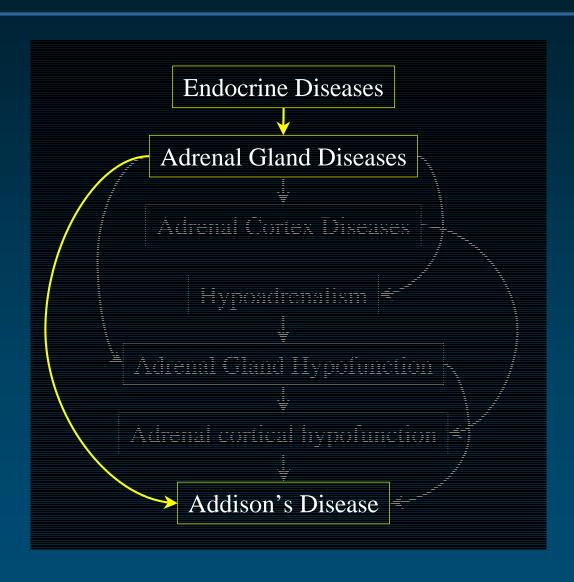
# From concept spaces to ontologies

1. Structural approach

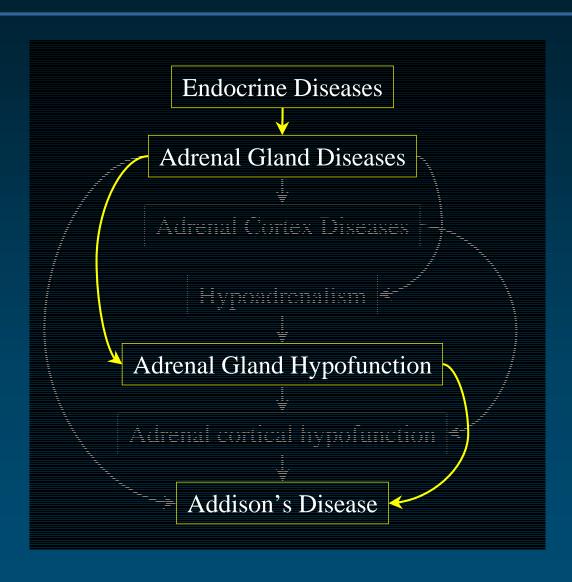
#### AD in UMLS Contexts



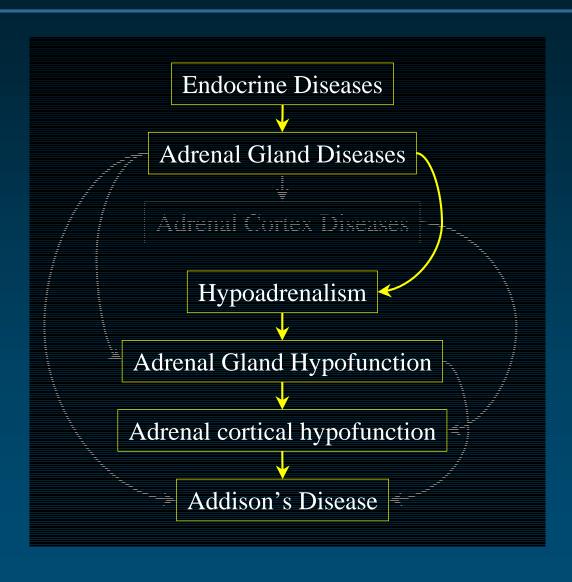
#### AD in UMLS SNOMED context



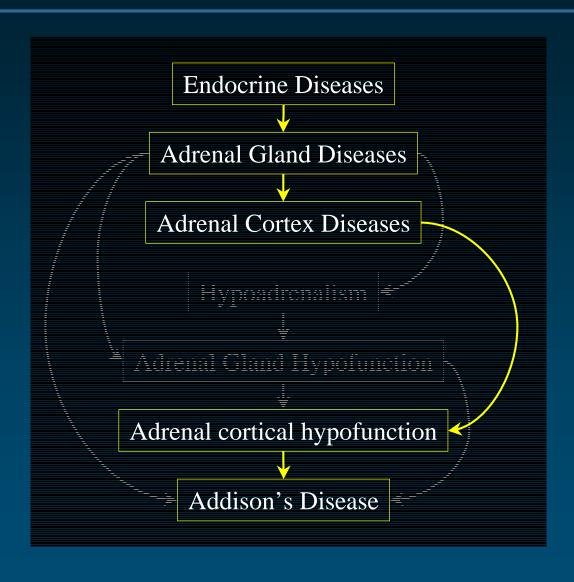
#### AD in UMLS MeSH context



#### AD in UMLS Read Codes context



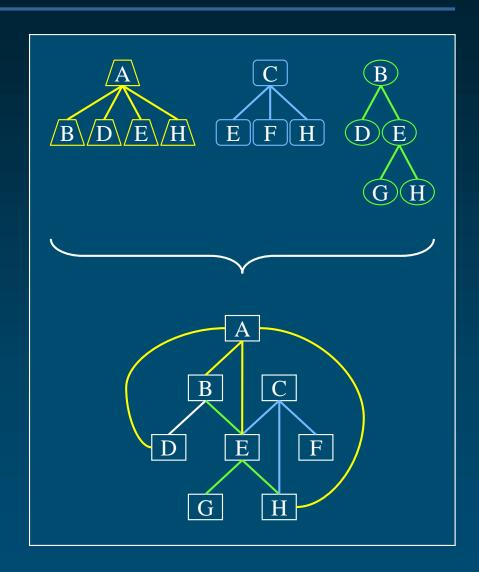
#### AD in UMLS AOD Thes. context



# Hierarchical relationships in the UMLS

#### Origin

- Inherited from source vocabularies
  - Called Parent / Child
- Specifically generated
  - Called Broader / Narrower
- Combined hierarchies
  - Possibly heterogeneous semantics
  - Directed acyclic graph (DAG) structure

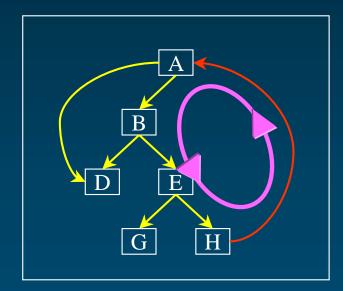


## Actually, there are some cycles



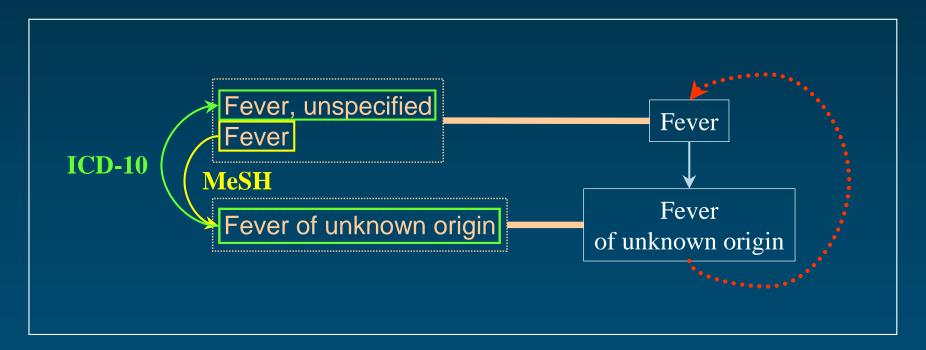
# Issues with cycles

- **♦** Theoretical
  - Violate the antisymmetry property of partial ordering relations
- ◆ Practical
  - Loops in graph traversal



# Cycle due to underspecification

- Specified and underspecified terms
  - May appear at different levels in a source hierarchy
  - Are clustered into the same concept (same meaning)



Nausea and Vomiting

#### Other causes

- Compound terms
- Nausea and VomiNagsea and Womittingg

- Metadata
  - HYDROCELE, Hydrocele
- Classes and member
  - Purines, Purine
- Organizational conventions
  - Acid + Base Salt + Water
- ◆ Idiopathic
  - Wrong relationships
  - Use of non-hierarchical relationships in "hierarchies"

# From concept spaces to ontologies

2. Semantic approach

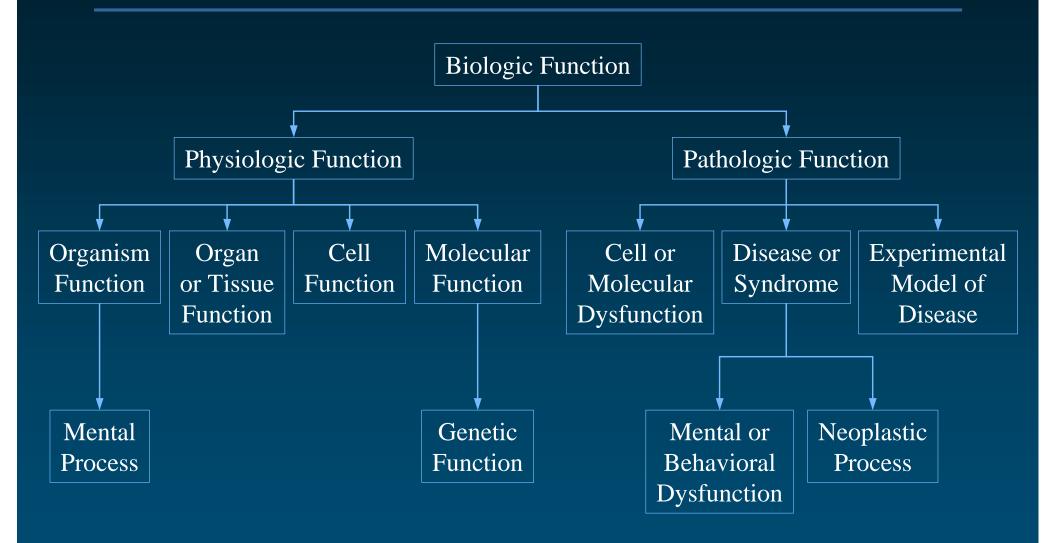
#### Semantic Network

- ◆ Semantic types (134)
  - tree structure
  - 2 major hierarchies
    - Entity
      - Physical Object
      - Conceptual Entity
    - Event
      - Activity
      - Phenomenon or Process

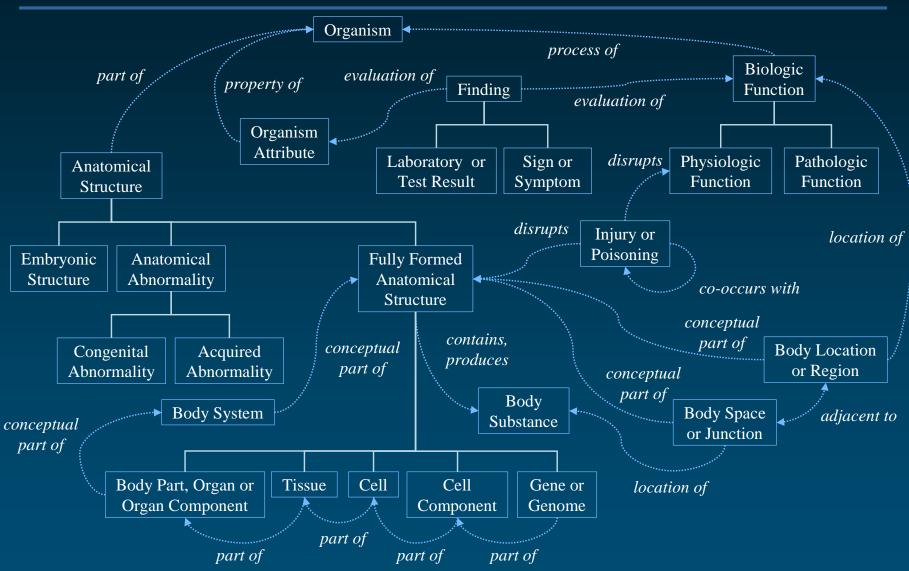
#### Semantic Network

- Semantic network relationships (54)
  - hierarchical (isa = is a kind of)
    - among types
      - Animal isa Organism
      - Enzyme isa Biologically Active Substance
    - among relations
      - treats *isa* affects
  - non-hierarchical
    - Sign or Symptom *diagnoses* Pathologic Function
    - Pharmacologic Substance *treats* Pathologic Function

# "Biologic Function" hierarchy (isa)



# Associative (non-isa) relationships

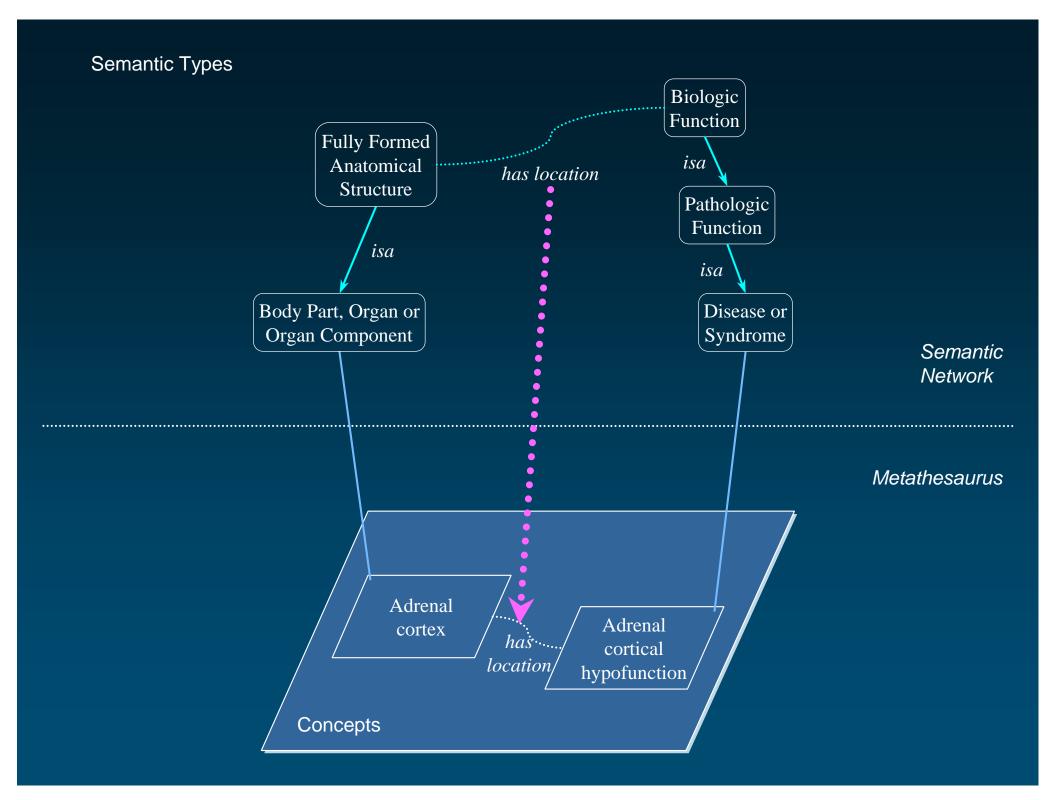


#### Role

- ◆ A relationship between 2 STs is a possible link between 2 concepts that have been assigned to those STs
  - The relationship may or may not hold at the concept level
  - Other relationships may apply at the concept level
- A child ST inherits properties from its parents (isa relationships)

## **Applications**

- ◆ To help qualify inter-concept relationships
  - using the relationships defined between their semantic types in the semantic network
- ◆ To strengthen the structure of the Metathesaurus
  - a relationship between 2 concepts should be consistent with the relationships defined between their semantic types in the semantic network
- Semantic interpretation
  - finding semantic relationships between concepts in text



# Experiment

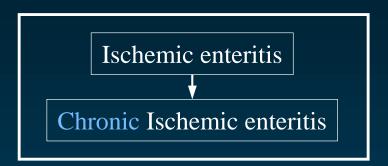
- ◆ 3764 concepts related to Heart
- ◆ 6894 pairs of related concepts
  - A relation can be inferred unambiguously from the Semantic Network (65%)
  - Multiple semantic links possible (22%)
  - Violation of the Semantic Network (13%)
    - Wrong inter-concept relationship
    - Wrong categorization
    - Both

# From concept spaces to ontologies

3. Linguistic approach

## Modifiers and relations (1)

 Adjectival modification generally induces hyponymy

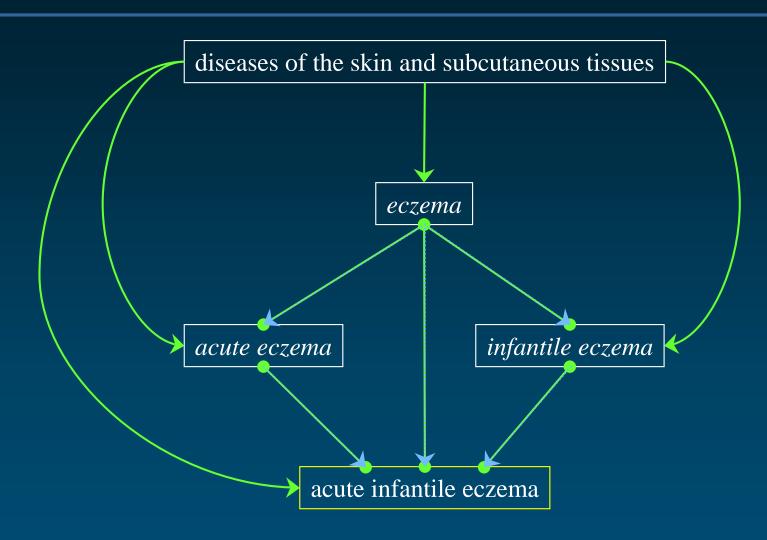


- ◆ Names "X" and "mod X"
  - Should name different concepts
  - Concept "X" should be a supertype of "mod X" (assuming that "X" and "mod X" have a common supertype)
- Applications
  - Identify relationships among concepts (in a terminology)

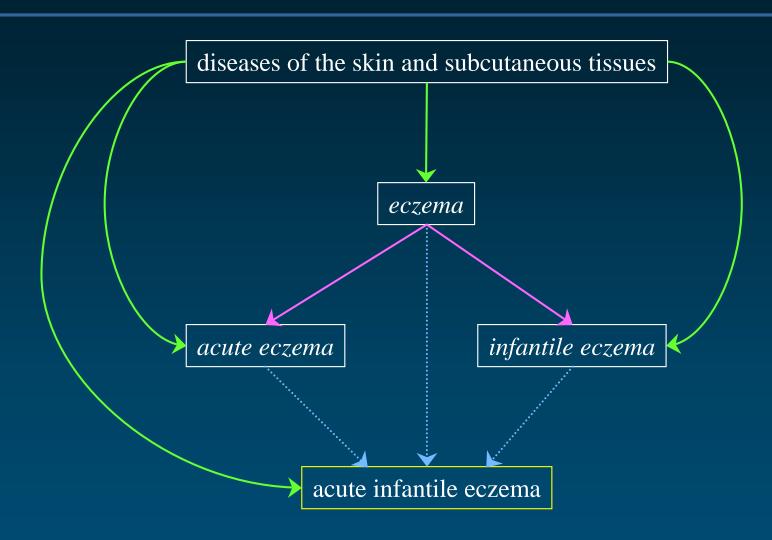
# Experiment

- ◆ 28,851 pairs of terms
  - Original SNOMED term
  - Transformed term (found in UMLS)
- Corresponding relationship in the Metathesaurus
  - Hierarchical in 50% of the cases
  - « Sibling » in 25% of the cases
  - Missing in 25% of the cases

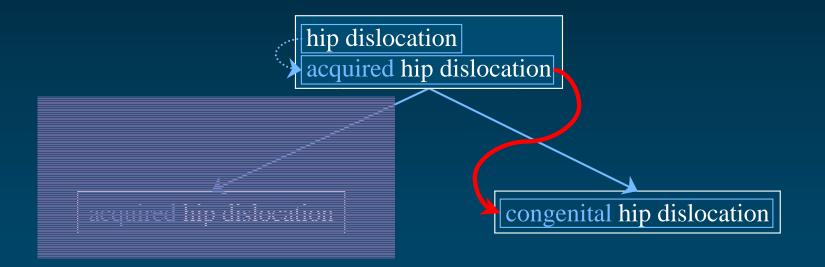
# Lack of structure within a source



# Lack of links across vocabularies



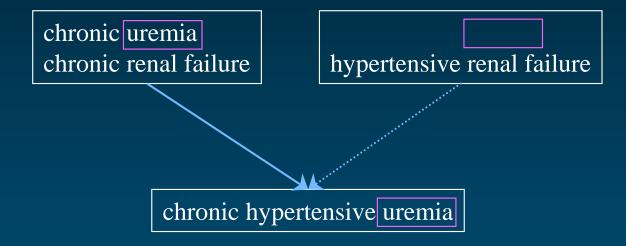
# Underspecified terms



# Plesionymy

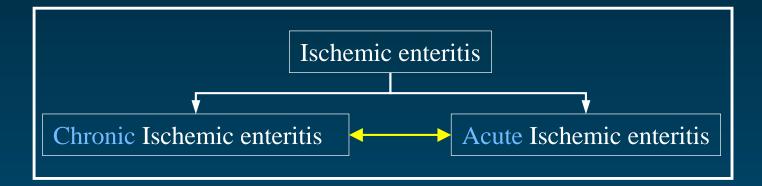
posttransfusion hepatitis
posttransfusion viral hepatitis

# Missing synonymy



# Modifiers and relations (2)

- Opposite modifiers modifiying a term "X"
  - Should name concepts distinct from "X"
  - Should name subtypes of "X"



- Applications
  - Assess consistency

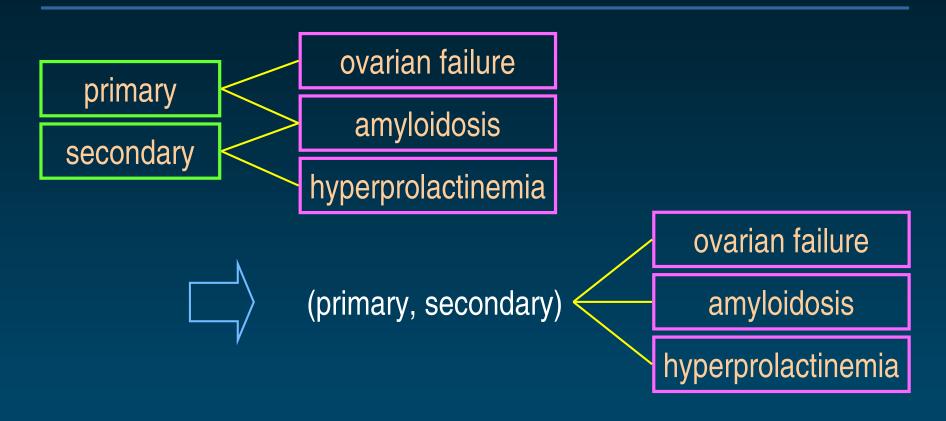
# Experiment

◆ 4 pairs of frequently occurring opposite modifiers

(acute, chronic)(unilateral, bilateral)(primary, secondary)(acquired, congenital)

- **♦** Elements studied
  - Presence of the terms and their context
  - Relationships between the 2 modified terms
  - Relationships between each term and its context

# Method Transforming terms



primary ovarian failure primary amyloidosis primary hyperprolactinemia secondary ovarian failure secondary amyloidosis secondary hyperprolactinemia

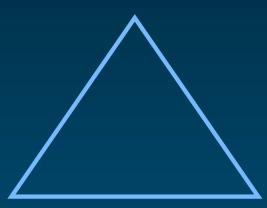
# Results Acquired/congenital

		UMLS	
present	Both (e.g.,acquired keratodermia + congenital keratodermia)	97	10%
	« Acquired » term only	76	8%
	« Congenital » term only	801	82%
	Context term (e.g., keratodermia)	418	43%
« Acquired » and « congenital » terms siblings		51	5%
Relationship Of « Acquired » Or « congenital » terms To context	child	181	17%
	siblings	93	9%
	synonyms	82	8%
	none	715	67%

# Discussion

Is the concept represented in the ontology?

concept



symbol

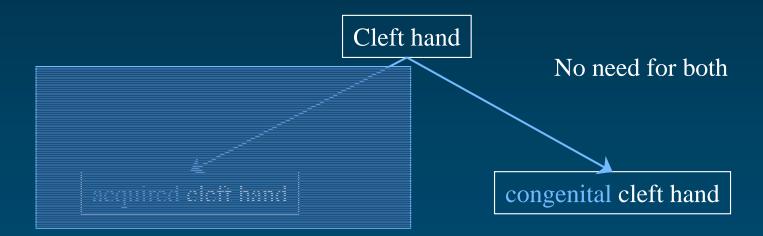
Is the term present in the terminology?

referent

Does the referent exist in the world?

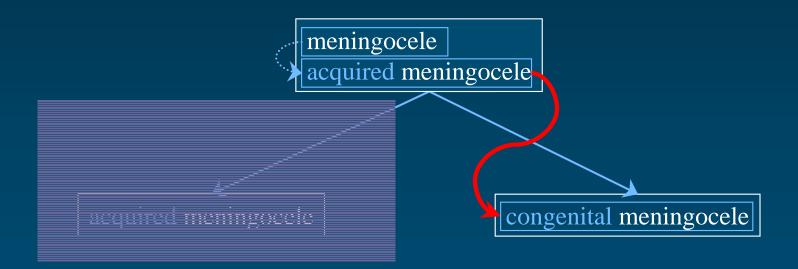
## Missing referent

- We artificially created terms by associating modifiers with context
- Medical knowledge



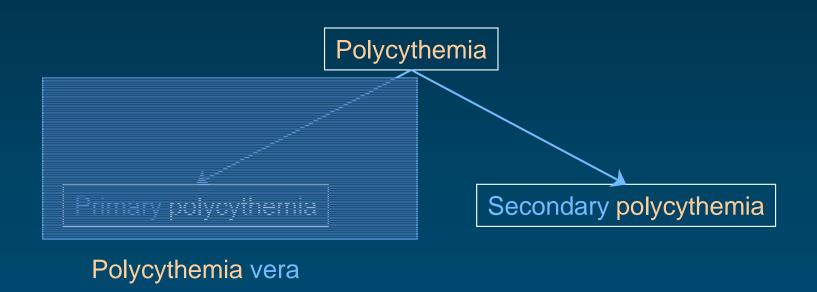
## Missing concept

- Knowledge representation, knowledge acquisition
- Distinction among concepts
- ◆ Typical form



# Missing symbol

- ◆ Lexical knowledge
- Synonymy



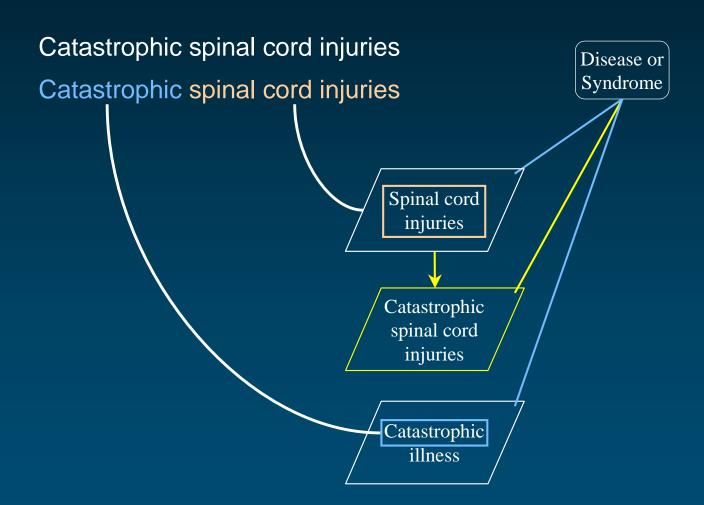
## Modifiers and relations (3)

- ◆ Modifiers should induce the same kind of relation when applied to different terms "X" and "Y"
  - If rel("mod X", "X")
  - And "X" and "Y" subtypes of "Z"
  - Then rel("mod Y", "Y")
- Application
  - Extend an existing terminology/ontology with a corpus
    - searching for "mod Y"
    - while knowing "mod X" and "Y"

# Experiment

- ◆ 3 million simple noun phrases extracted from MEDLINE citations
- ◆ 125,000 new terms identified and associated with an existing UMLS concept
- ♦ 83% of the associations are relevant (sample reviewed manually)

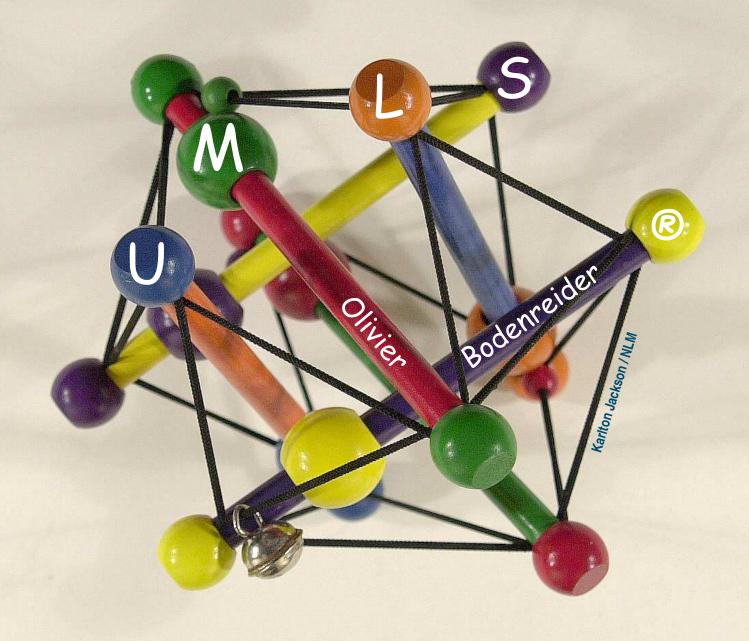
# Example



# Conclusions

### Conclusions

- ◆ The UMLS certainly has the potential to provide [most of] the concepts and relationships needed in a biomedical ontology
- ◆ However, additional effort is needed for selecting relationships meeting ontological requirements
- Comparison to other knowledge sources would also be helpful
  - Medical (GALEN, SNOMED-RT/CT)
  - General (Cyc, WordNet)
  - Specialized (GeneOntology)



A Semantic Space For Kids To Play With®

### Contact information



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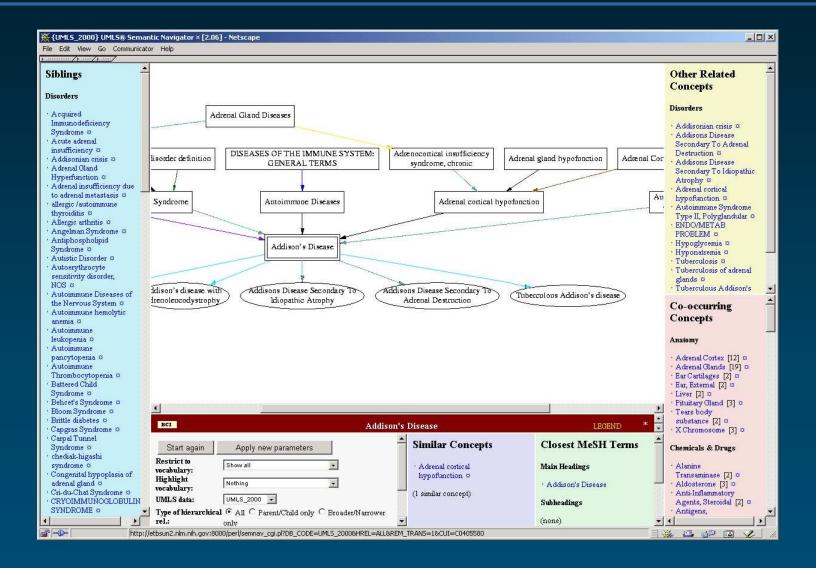
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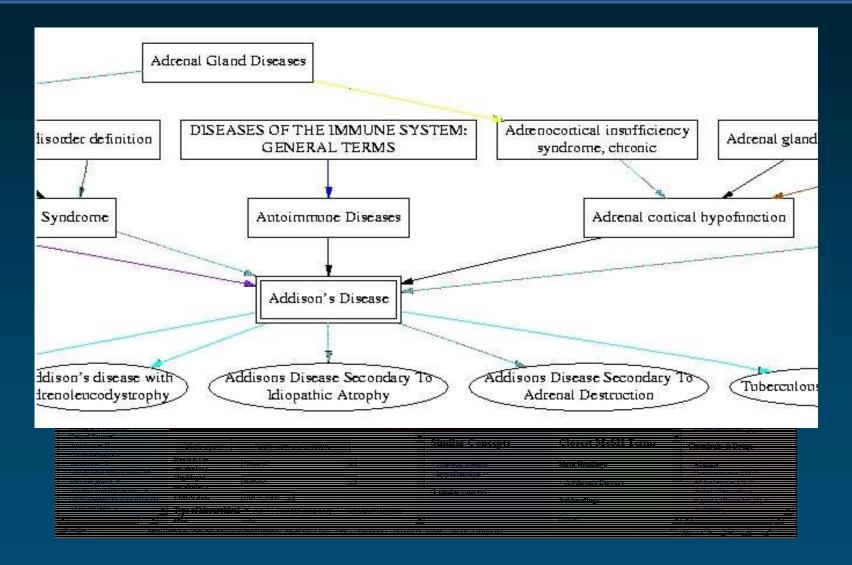
# Appendix 1

UMLS Semantic Navigator

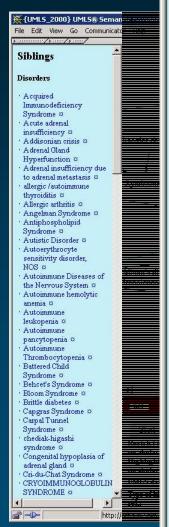
# **UMLS Semantic Navigator**



# UMLS Semantic Navigator Concepts



### UMLS Se



#### Siblings

#### Disorders

- · Acquired Immunodeficiency Syndrome ©
- Acute adrenal insufficiency
- · Addisonian crisis 🌣
- Adrenal Gland
   Hyperfunction □
- Adrenal insufficiency due to adrenal metastasis
- · allergic /autoimmune thyroiditis ⋈
- · Allergic arthritis ©
- · Angelman Syndrome ¤
- Antiphospholipid
   Syndrome □
- · Autistic Disorder 🌣
- Autoerythrocyte sensitivity disorder, NOS
- Autoimmune Diseases of the Nervous System
- · Autoimmune hemolytic anemia ¤
- · Autoimmune leukopenia ¤
- · Autoimmune pancytopenia ≈
- Autoimmune
   Thrombocytopenia ≈
- Battered Child Syndrome

# igator Concepts

	Camerols
Mais Haulings	



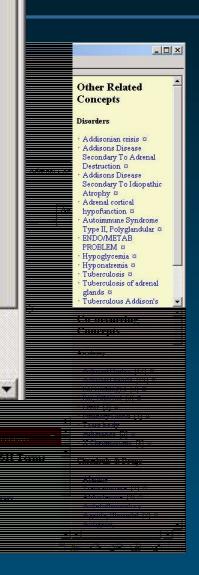
## **UMLS Semantic N**

#### Other Related Concepts

#### Disorders

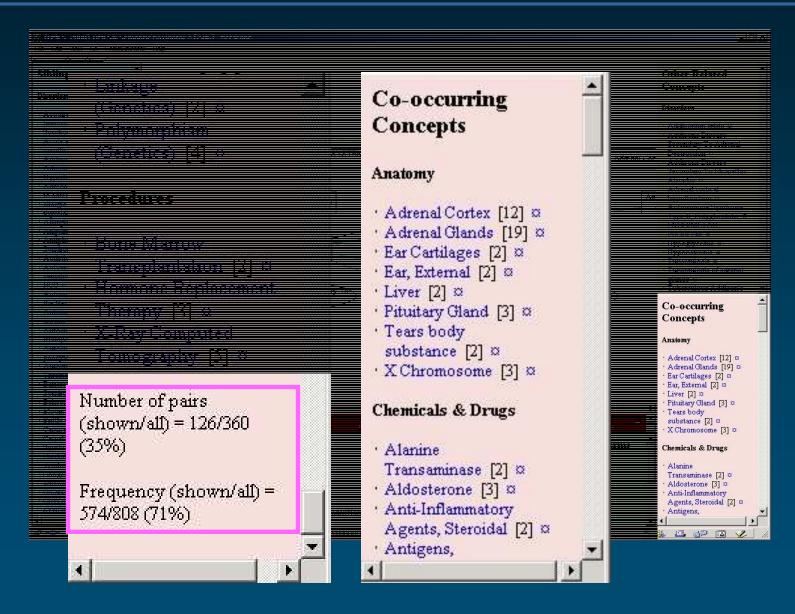
- · Addisonian crisis 🌣
- ' Addisons Disease Secondary To Adrenal Destruction □
- · Addisons Disease Secondary To Idiopathic Atrophy ≈
- Adrenal cortical hypofunction □
- Autoimmune Syndrome Type II, Polyglandular □
- PROBLEM ¤
- · Hypoglycemia 🌣
- · Hyponatremia ♡
- · Tuberculosis ¤
- Tuberculosis of adrenal glands ¤
- · Tuberculous Addison's

# oncepts





# UMLS Semantic Navigator Concepts





### UMLS Semantic N

